



# Database Performance at Gitlab.com

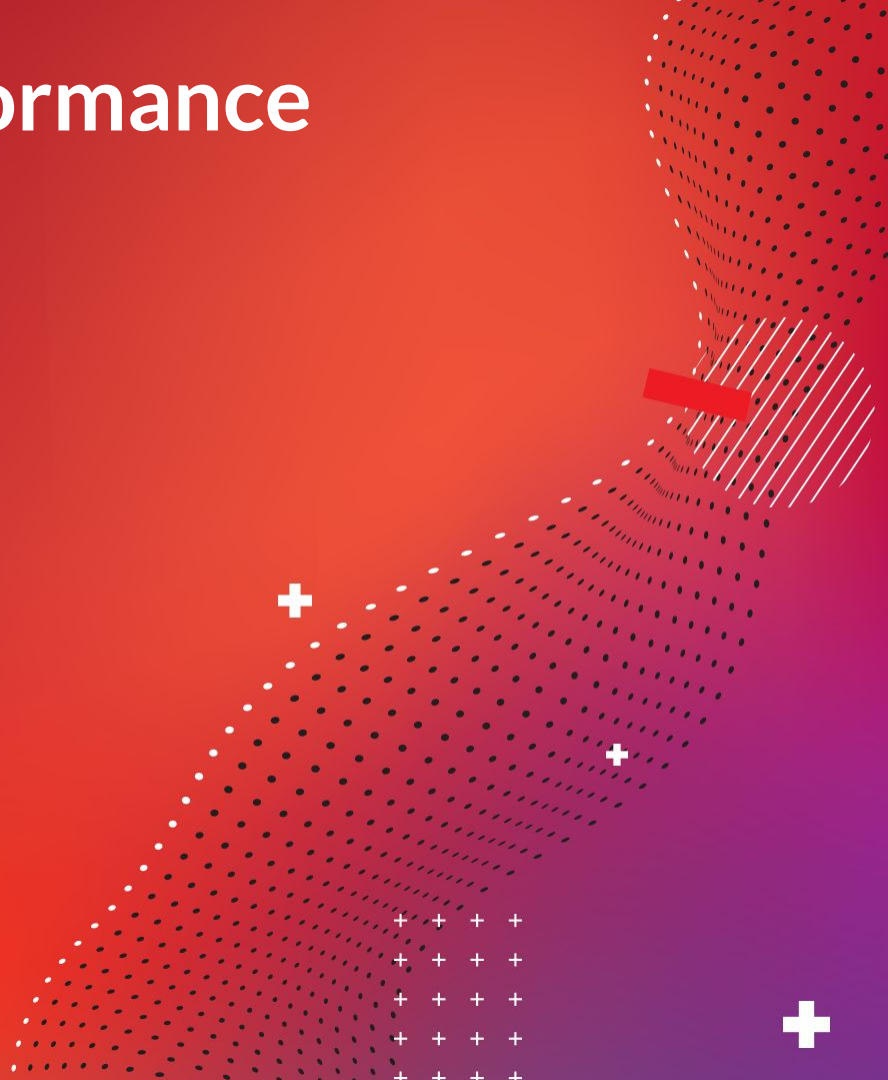
Jose Cores Finotto,  
GitLab,  
Staff Database Reliability Engineer



Nikolay Samokhvalov,  
Postgres.ai,  
Founder



**HighLoad++**  
Becha 2021





# Database Performance at Gitlab.com

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Staff Database Reliability Engineer



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Founder



- My name is Jose Cores Finotto I work with the Infrastructure team at GitLab.
- I have been a part of the GitLab team since September 2018.
- Background in large organizations with extensive experience in Infrastructure, especially in relational databases.



# Speaker: Nikolay Samokhvalov

- Database systems:

- 2002-2005:



Microsoft  
**SQL Server** 2000

- since 2005:



PostgreSQL

- Worked on XML data type and functions (2005-2007)

- Long-term community activist – [#RuPostgres](#), [Postgres.tv](#)

- Conferences Program Committee



PGIBZ  etc.

- Current business:

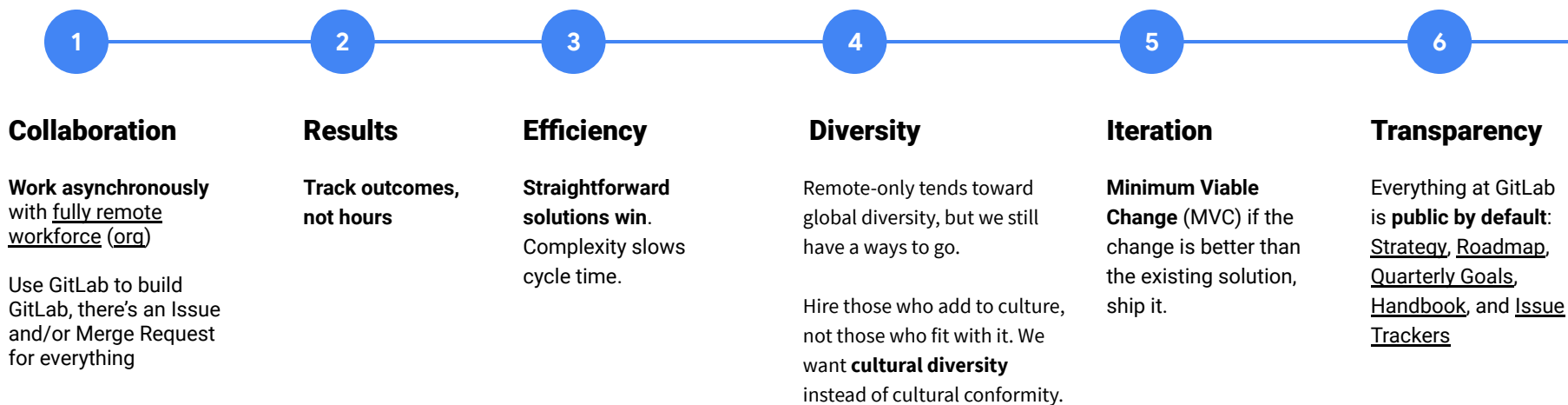


Postgres.ai





- GitLab
- Architecture and challenges
- Performance analysis
- postgres-checkup
- Joe Bot & Database Lab





## The open source project

Used by more than

**100,000**

organizations

A community of

**3,000+**

code contributors



We release every month on the 22nd and there is a [publicly viewable direction](#) for the product.

[Learn more from our blog →](#)



## The company



GitLab Inc. is an open-core company that [sells subscriptions](#) that offer more features and support for GitLab.

[Learn about open core →](#)



GitLab, the product is a complete [DevOps platform](#), delivered as a single application, fundamentally changing the way Development, Security, and Ops teams collaborate.

[Learn more about our product →](#)

All remote with

# 1297

team members

Over

# 30 million

estimated registered users

Located in

# 67

countries





## 2011

GitLab, the open source project began.

## 2015

We joined Y Combinator and started growing faster.  
Join [our team](#).



Most of our internal procedures can be found in a [publicly viewable 5000+ page handbook](#) and our objectives are documented in [our OKRs](#).



[Our mission](#) is to change all creative work from read-only to read-write so that **everyone can contribute**. This is part of our overall [strategy](#).



[Our values](#) are Collaboration, Results, Efficiency, Diversity, Inclusion & Belonging, Iteration, and Transparency (CREDIT) and these form an important part of [our culture](#).



Our Tanuki (Japanese for raccoon dog) logo symbolizes our values with a smart animal that works in a group to achieve a common goal, you can download it on [our press page](#).



The definitive guide to remote work [Download the playbook](#)

## Discover a more streamlined way to work

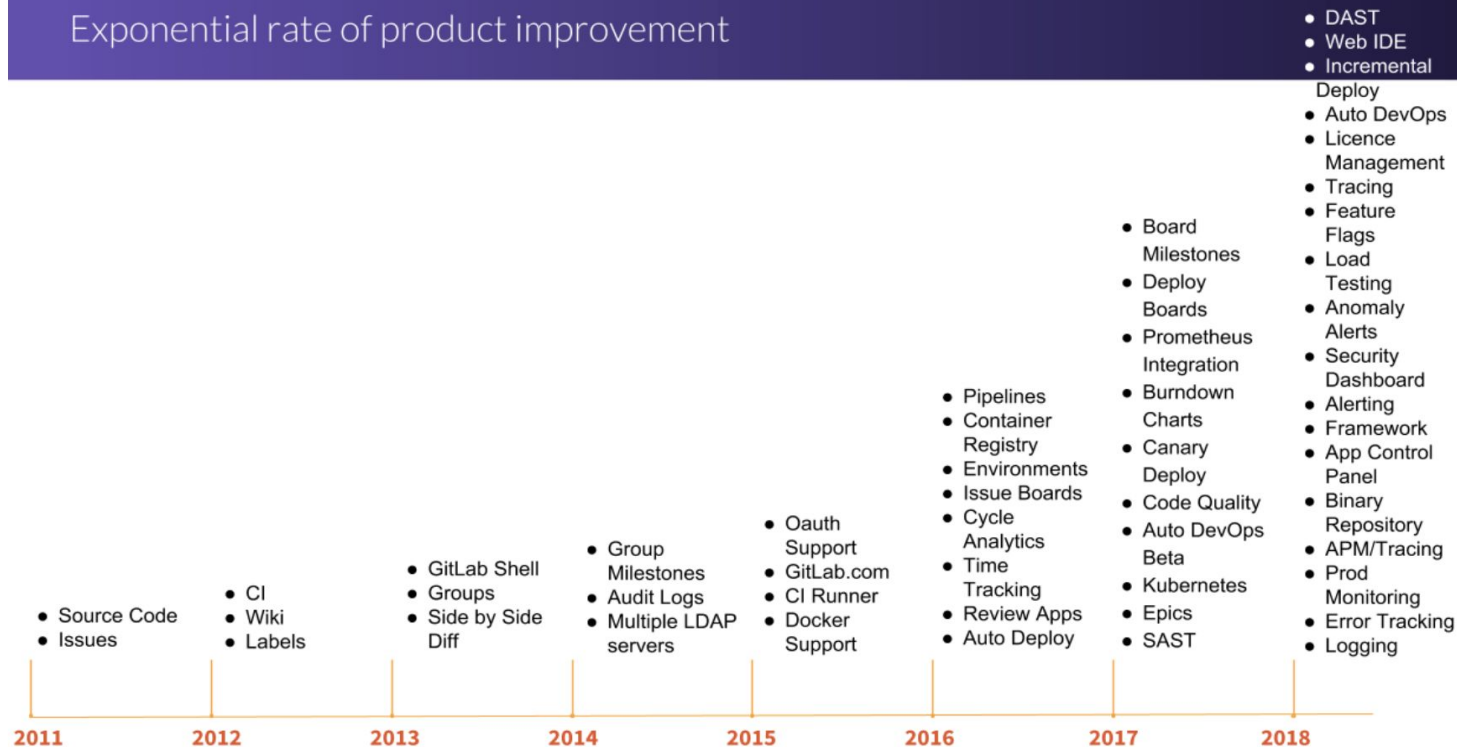
GitLab is a complete DevOps platform, delivered as a single application.

Manage	Plan	Create	Verify	Package	Secure	Release	Configure	Monitor	Protect
Subgroups	Issue Tracking	Source Code Management	Continuous Integration (CI)	Package Registry	SAST	Continuous Delivery	Auto DevOps	Runbooks	Container Scanning
Audit Events	Time Tracking	Code Review	Code Quality	Container Registry	DAST	Pages	Kubernetes Management	Metrics	Container Host Security
Audit Reports	Boards	Wiki	Code Testing and Coverage	Helm Chart Registry	Fuzz Testing	Review Apps	ChatOps	Incident Management	Container Network Security
Compliance Management	Epics	Static Site Editor	Load Testing	Dependency Proxy	Dependency Scanning	Advanced Deployments	Serverless	Logging	
Code Analytics	Roadmaps	Web IDE	Web Performance	Release Evidence	License Compliance	Feature Flags	Infrastructure as Code	Tracing	
DevOps Reports	Service Desk	Live Preview	Usability Testing	Git LFS	Secret Detection	Release Orchestration	Cluster Cost Management	Error Tracking	
Value Stream Management	Requirements Management	Snippets	Accessibility Testing		Vulnerability Management	Secrets Management		Product Analytics	
Insights	Quality Management		Merge Trains						
	Design Management								

# Feature development matrix



## Exponential rate of product improvement



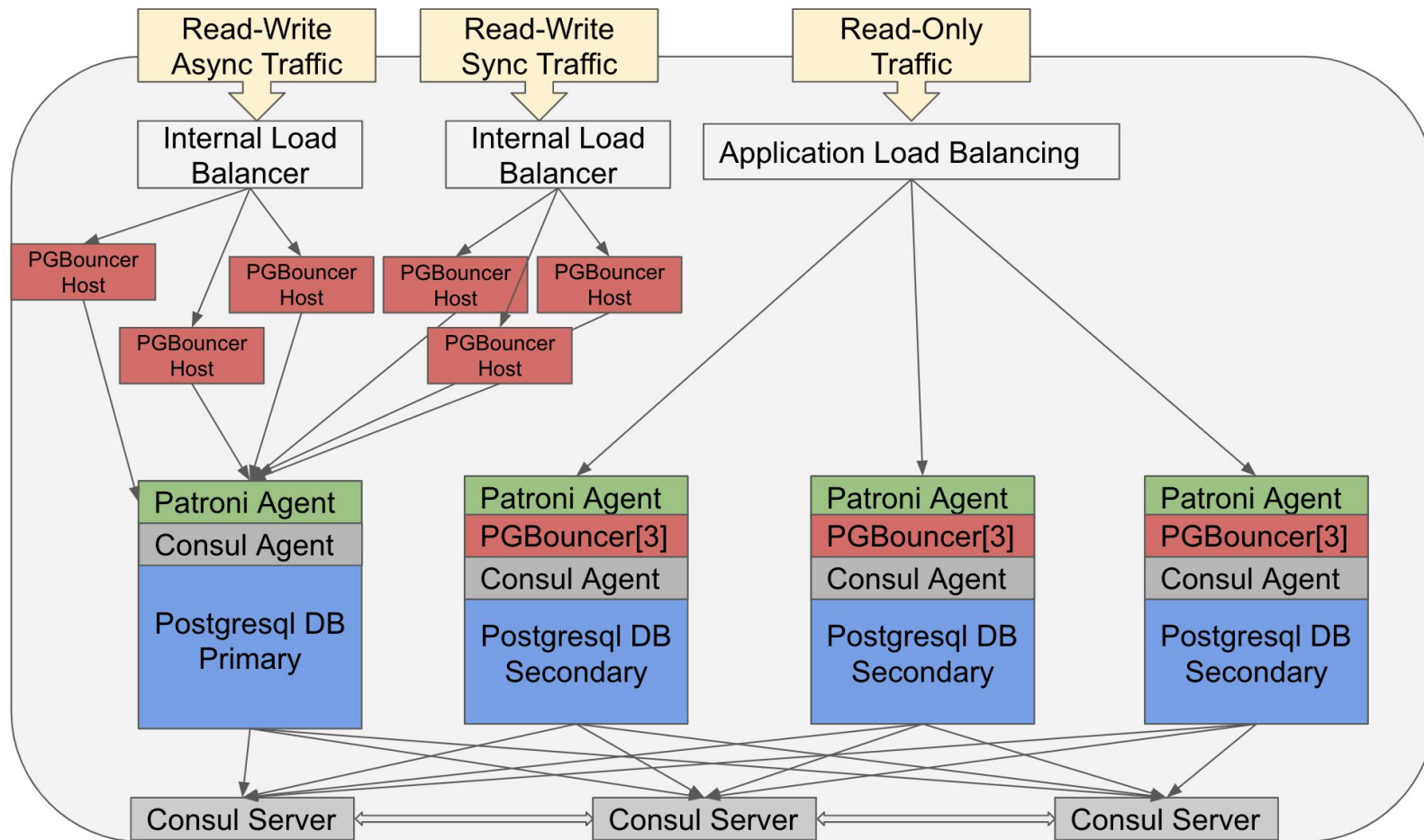
[about.gitlab.com/direction](https://about.gitlab.com/direction)



## **We have a hosted version of Gitlab:**

- Over 40 million daily git pull operations.
- More than 6k git requests per second.
- 750.000 git pushes a day.
- 60k to 80k transactions per second on the database
- 8 database replicas and 1 primary
- Database size : 14 TiB
- Hardware architecture GCP 96 cores with 624 GiB of RAM.

# Current Architecture

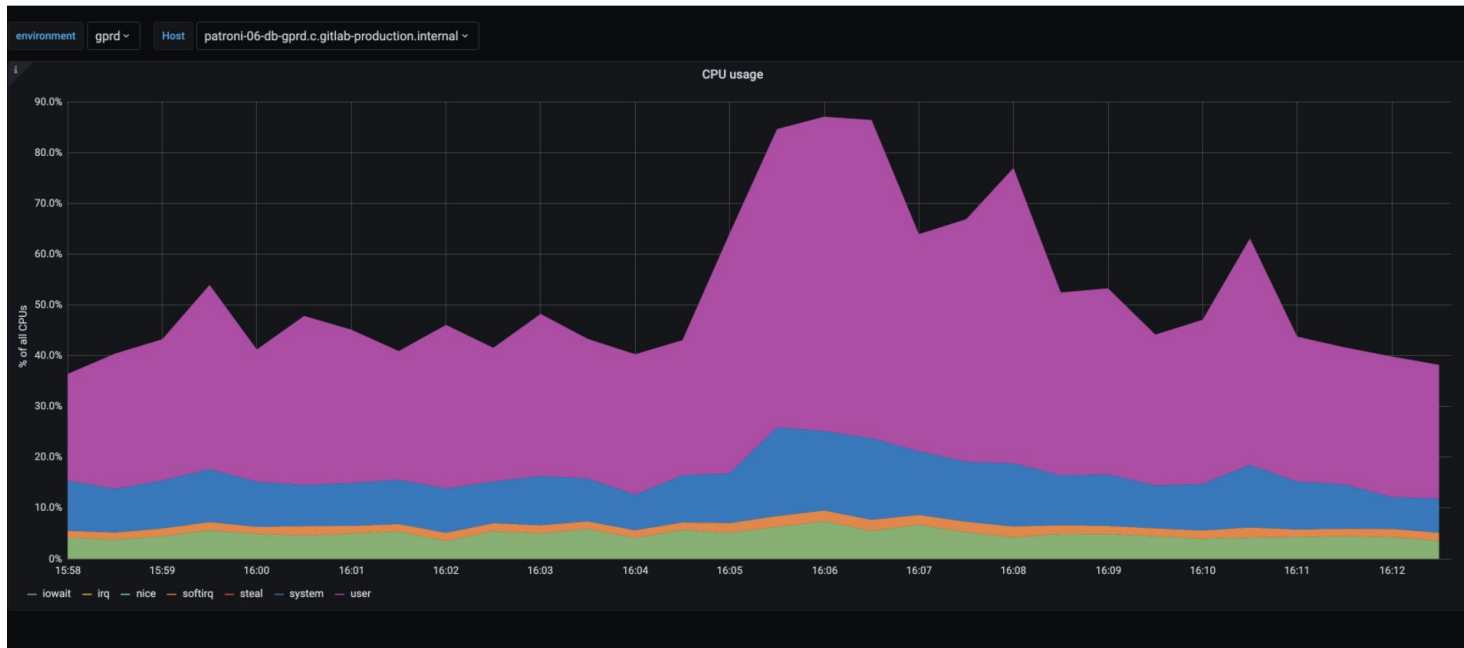




## Database performance peak - 12 of January - 16:06 AM



The following CPU utilization peak started at 16:05, reaching 87%:



- ☒ Evaluate the analysis report, metrics and queries. If applies, create new issues with the label `infradev` or `datastores` to propose new improvements to the database cluster overall.

# Performance degradation analysis



**Jose Finotto** @Finotto · 1 day ago

Owner



We had the following top 10 statements **by total time** in execution during this peak:

Query:

```
topk(10,
  sum by (queryid) (
    rate(pg_stat_statements_seconds_total{env="gprd", monitor="db", type="patroni", instance="patroni-06-db-gp
  )
)
```

In this analysis, we are considering a 15 minutes interval.

[https://thanos-query.ops.gitlab.net/graph?g0.range\\_input=15m&g0.end\\_input=2021-01-12%2016%3A15&g0.step\\_input=10&g0.max\\_source\\_resolution=0s&g0.expr=topk\(10%2C%20%0A%20%20sum%20by%20\(queryid\)%20\(%0A%20%20%20%20rate\(pg\\_stat\\_statements\\_seconds\\_total%7Benv%3D%22gprd%22%2C%20monitor%3D%22db%22%2C%20type%3D%22patroni%22%2Cinstance%3D%22patroni-06-db-gprd.c.gitlab-production.internal%3A9187%22%7D%5B1m%5D\)%0A%20%20\)%0A\)&g0.tab=0](https://thanos-query.ops.gitlab.net/graph?g0.range_input=15m&g0.end_input=2021-01-12%2016%3A15&g0.step_input=10&g0.max_source_resolution=0s&g0.expr=topk(10%2C%20%0A%20%20sum%20by%20(queryid)%20(%0A%20%20%20%20rate(pg_stat_statements_seconds_total%7Benv%3D%22gprd%22%2C%20monitor%3D%22db%22%2C%20type%3D%22patroni%22%2Cinstance%3D%22patroni-06-db-gprd.c.gitlab-production.internal%3A9187%22%7D%5B1m%5D)%0A%20%20)%0A)&g0.tab=0)

# Performance degradation analysis



**Jose Finotto** @Finotto · 1 day ago

Owner



The outputs are:

☐ Enable query history

```
topk(10,
  sum by (queryid) (
    rate(pg_stat_statements_seconds_total(env="gprd", monitor="db", type="patroni",instance="patroni-06-db-gprd.c.gitlab-production.internal:9187"){1m})
  )
)
```

Load time: 289ms  
Resolution: 10s  
Total time series



Execute

- insert metric at cursor

deduplication

partial response

Graph Console

15m



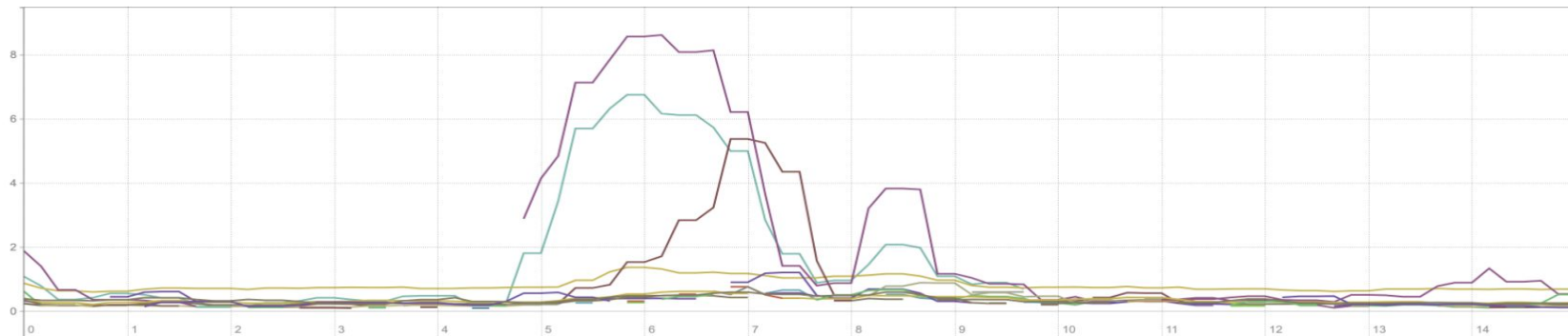
2021-01-12 16:15



10

☐ stacked

Only raw data





# Performance degradation analysis



☐ Enable query history

```
topk(10,
  sum by (queryid) (
    rate(pg_stat_statements_seconds_total{env="gprd", monitor="db", type="patroni",instance="patroni-06-db-gprd.c.gitlab-production.internal:9187"}[1m])
  )
)
```



Load time: 183ms  
Resolution: 10s  
Total time series: 1

Execute

- insert metric at cursor · ↕

deduplication

partial response

Graph

Console

◀ 2021-01-12 16:15:00 ▶

Element	Value
{queryid="3926004648916863976"}	0.8178287140222235
{queryid="-6386890822646776524"}	0.6909796111596127
{queryid="7164302182213446947"}	0.5237485621202116
{queryid="6507699644791286491"}	0.2640517462795186
{queryid="9095629593792855100"}	0.2503059345329853
{queryid="-402488551284107289"}	0.23028561521334467
{queryid="1712385180720443674"}	0.20701351823647401
{queryid="2298083782068675032"}	0.157706000044224
{queryid="-5002940052336095544"}	0.12475411511170224
{queryid="7366711010424350814"}	0.12231413964376164

[Remove Graph](#)

Add Graph

# Performance degradation analysis



Jose Finotto @Finotto · 1 day ago

Owner



Those queryIds are the following SQL statements:

QueryId	Query
3926004648916863976	<pre>SELECT "ci_builds".* FROM "ci_builds" INNER JOIN "projects" ON "projects"."id" = "ci_builds"."project_id" ci_builds.project_id = project_features.project_id LEFT JOIN (SELECT "ci_builds"."project_id", count() "ci_builds"."type" = \$1 AND ("ci_builds"."status" IN (\$2)) AND "ci_builds"."runner_id" IN (SELECT "ci_r "ci_runners"."runner_type" = \$3) GROUP BY "ci_builds"."project_id") AS project_builds ON ci_builds.p ("ci_builds"."status" IN (\$4)) AND "ci_builds"."runner_id" IS NULL AND "projects"."shared_runners_en = \$6 AND (project_features.builds_access_level IS NULL or project_features.builds_access_level &gt; \$7 ("projects"."visibility_level" = \$9 OR (EXISTS (WITH RECURSIVE "base_and_ancestors" AS ((SELECT ' (namespaces.id = projects.namespace_id)) UNION (SELECT "namespaces".* FROM "namespaces", "t "namespaces"."id" = "base_and_ancestors"."parent_id")) SELECT \$10 FROM "base_and_ancestors" A namespace_statistics ON namespace_statistics.namespace_id = namespaces.id WHERE "namespace (COALESCE(namespaces.shared_runners_minutes_limit, \$11, \$12) = \$13 OR COALESCE(namespace_ COALESCE((namespaces.shared_runners_minutes_limit + COALESCE(namespaces.extra_shared_run COALESCE(namespaces.extra_shared_runners_minutes_limit, \$17)), \$18) * \$19)))) AND (NOT EXISTS "taggings"."taggable_type" = \$21 AND "taggings"."context" = \$22 AND (taggable_id = ci_builds.id) A ORDER BY COALESCE(project_builds.running_builds, \$25) ASC, ci_builds.id ASC /application:web,correlation_id:01EVX3GF3VGAVE6TYFMR82EJFN/</pre>
-6386890822646776524	<pre>SELECT "users".* FROM "users" INNER JOIN "project_authorizations" ON "users"."id" = "project_auth "project_authorizations"."project_id" = \$1 /application:web,correlation_id:Lmz5Aaf8Vpa/</pre>
7164302182213446947	<pre>UPDATE "ci_builds" SET "runner_id" = 380987, "status" = 'running', "started_at" = '2020-10-29 21:00 "updated_at" = '2020-10-29 21:00:54.568589', "lock_version" = 2 WHERE "ci_builds"."id" = 8201577 /application:web,correlation_id:4ze9HF2IXC9/</pre>
6507699644791286491	<pre>SELECT SUM(((("project_statistics"."repository_size" + "project_statistics"."lfs_objects_size") - "proj INNER JOIN routes rs ON rs.source_id = projects.id AND rs.source_type = 'Project' INNER JOIN "proj "project_statistics"."project_id" = "projects"."id" WHERE (rs.path LIKE 'gitlab-org/%') AND ("project_s "project_statistics"."lfs_objects_size") &gt; "projects"."repository_size_limit" AND "projects"."repository_s /application:web,controller:merge_requests,action:index,correlation_id:HlfxW7lr8b1/</pre>

# Performance degradation analysis



**Jose Finotto** @Finotto · 1 day ago

Owner



We had the following top 10 statements **by total calls** in execution during this peak:

Query:

```
topk(10,
  sum by (queryid) (
    rate(pg_stat_statements_calls_total{env="gprd", monitor="db", type="patroni", instance="patroni-06-db-gprd"
  )
)
```

In this analysis, we are considering a 15 minutes interval.

[https://thanos-query.ops.gitlab.net/graph?g0.range\\_input=15m&g0.end\\_input=2021-01-12%2016%3A15&g0.step\\_input=10&g0.moment\\_input=2021-01-08%2014%3A15%3A00&g0.max\\_source\\_resolution=0s&g0.expr=topk\(10%2C%20%0A%20%20sum%20by%20\(queryid\)%20\(%0A%20%20%20%20rate\(pg\\_stat\\_statements\\_calls%7Benv%3D%22gprd%22%2C%20monitor%3D%22db%22%2C%20type%3D%22patroni%22%2Cinstance%3D%22patroni-06-db-gprd.c.gitlab-production.internal%3A9187%22%7D%5B1m%5D\)%0A%20%20\)%0A\)&g0.tab=0](https://thanos-query.ops.gitlab.net/graph?g0.range_input=15m&g0.end_input=2021-01-12%2016%3A15&g0.step_input=10&g0.moment_input=2021-01-08%2014%3A15%3A00&g0.max_source_resolution=0s&g0.expr=topk(10%2C%20%0A%20%20sum%20by%20(queryid)%20(%0A%20%20%20%20rate(pg_stat_statements_calls%7Benv%3D%22gprd%22%2C%20monitor%3D%22db%22%2C%20type%3D%22patroni%22%2Cinstance%3D%22patroni-06-db-gprd.c.gitlab-production.internal%3A9187%22%7D%5B1m%5D)%0A%20%20)%0A)&g0.tab=0)

Edited by Jose Finotto 1 day ago

# Performance degradation analysis



**Jose Finotto** @Finotto · 1 day ago

Owner



The outputs are:

☐ Enable query history

```
topk(10,
  sum by (queryid) (
    rate(pg_stat_statements_calls(env="gprd", monitor="db", type="patroni", instance="patroni-06-db-gprd.c.gitlab-production.internal:9187"))[1m])
)
```

Load time: 283ms  
Resolution: 10s  
Total time series: 17

Execute

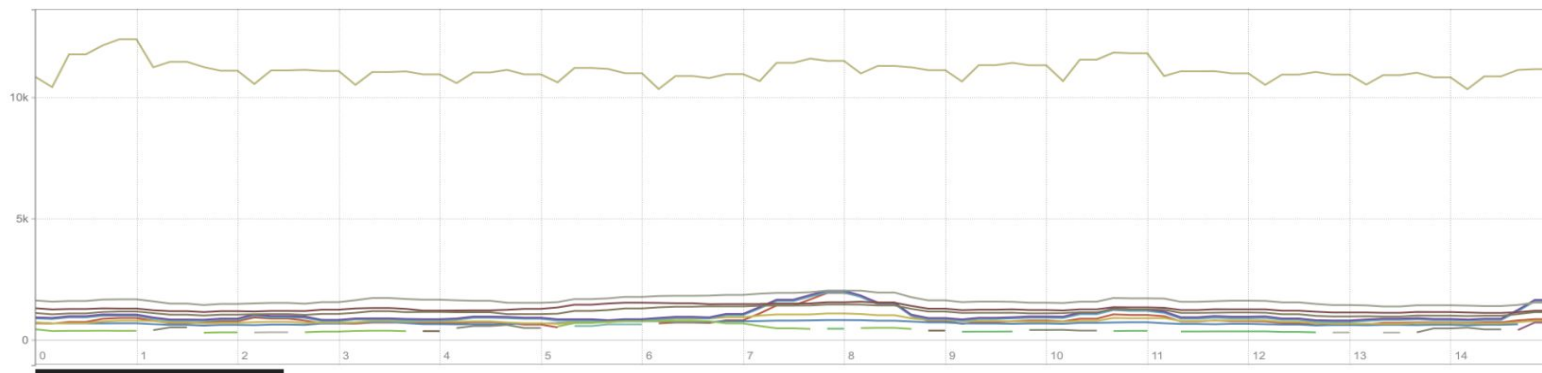
- insert metric at cursor · ▾

deduplication

partial response

Graph Console

15m + ◀ 2021-01-12 16:15 ▶ 10 ☐ stacked Only raw data ▾



# Performance degradation analysis



Those queryIds are the following SQL statements:

QueryId	Query
833913155023572892	SELECT \$1
73367110635711796	SELECT "projects".* FROM "projects" WHERE "projects"."id" = \$1 LIMIT \$2 <i>/application:web,controller:issues,action:index,correlation_id:tt4UclFKFU9/</i>
6769309683899657633	SELECT "routes".* FROM "routes" WHERE "routes"."source_id" = \$1 AND "routes"."source_type" = \$2 LIMIT \$3 <i>/application:web,controller:issues,action:index,correlation_id:tt4UclFKFU9/</i>
6974950735891200787	SELECT "namespaces".* FROM "namespaces" WHERE "namespaces"."id" = \$1 LIMIT \$2 <i>/application:web,correlation_id:e7d284e6-07ff-4c0e-ae4a-e6880d46b20a/</i>
6749620766035719574	SELECT "taggings".* FROM "taggings" WHERE "taggings"."taggable_id" = \$1 AND "taggings"."taggable_type" = \$2 <i>/application:web,controller:projects,action:show,correlation_id:ZiDjveMIXa/</i>
6504150523421693673	SELECT "tags".* FROM "tags" INNER JOIN "taggings" ON "tags"."id" = "taggings"."tag_id" WHERE "taggings"."taggable_id" = \$1 AND "taggings"."taggable_type" = \$2 AND (taggings.context = \$3 AND taggings.tagger_id IS NULL) <i>/application:web,correlation_id:dnT2GXhKuX2/</i>
-2372450153195223637	SELECT \$1 AS one FROM ((SELECT "ci_runners".* FROM "ci_runners" INNER JOIN "ci_runner_projects" ON "ci_runner_projects"."runner_id" = "ci_runners"."id" WHERE "ci_runner_projects"."project_id" = \$2) UNION ALL (SELECT "ci_runners".* FROM "ci_runners" INNER JOIN "ci_runner_namespaces" ON "ci_runner_namespaces"."runner_id" = "ci_runners"."id" INNER JOIN "namespaces" ON "namespaces"."id" = "ci_runner_namespaces"."namespace_id" AND "namespaces"."type" = \$3 WHERE "namespaces"."id" IN (WITH RECURSIVE "base_and_ancestors" AS ((SELECT "namespaces".* FROM "namespaces" INNER JOIN "projects" ON "projects"."namespace_id" = "namespaces"."id" WHERE "namespaces"."type" = \$4 AND "projects"."id" = \$5) UNION (SELECT "namespaces".* FROM "namespaces", "base_and_ancestors" WHERE "namespaces"."id" = "base_and_ancestors"."id" AND "namespaces"."type" = \$4)))



Nikolay and his team develop postgres-checkup (<https://gitlab.com/postgres-ai/postgres-checkup>) -- a tool for automated health-checks of Postgres databases, that contains:

- 28 reports, checking various aspects of Postgres production database health and performing detailed SQL workload analysis.
- Reports contain 3 detailed parts: observations, conclusions, and recommendations.
- Very lightweight checks, unobtrusive activities working well under heavy load, in large databases. Does not require any setup on the servers.
- Multi-node analysis: the master is checked together with its replicas.

# postgres-checkup

- Weekly tech audit reports that augment the existing monitoring (prometheus, postgres\_exporter, grafana, thanos):
  - track Postgres and components versions
  - track settings and setting deviations
  - bloat control (tables, indexes)
  - index health (invalid, unused, redundant, etc)
  - deep query analysis
  - object sizes
  - int4 PKs
  - ... and more



# H002 Unused Indexes

## Observations

Data collected: 2021-01-11 13:40:38 +0000 UTC  
Current database: gitlabhq\_production  
Stats reset: 6 mons 27 days 14:26:00 ago (2020-06-13 23:13:01 +0000 UTC)

## Never Used Indexes

The list is limited to 50 items. Total: 178.

#	Table	Index	10.220.16.106 usage	10.220.16.101 usage	10.220.16.102 usage	10.220.16.103 usage	10.220.16.104 usage	10.220.16.105 usage	10.220.16.107 usage	10.220.16.108 usage	▼ Index size	Table size
	=====TOTAL=====										165.66 GiB	7.27 TiB
1	ci_builds	index_ci_builds_on_protected	0	0	0	0	0	0	0	0	45.55 GiB	0.92 TiB
2	ci_builds	index_ci_builds_on_user_id_and_created_at_and_type_eq_ci_build	0							0	30.01 GiB	0.92 TiB
3	ci_builds	index_ci_builds_on_queued_at	0	0	0	0	0	0	0	0	22.23 GiB	0.92 TiB
4	merge_request_diffs	index_merge_request_diffs_on_external_diff_store	0	0	0	0	0	0	0	0	8.41 GiB	27.54 GiB
5	projects	index_projects_on_runners_token	0	0	0	0	0	0	0	0	3.90 GiB	4.77 GiB
6	projects	index_projects_on_mirror_last_successful_update_at	0	0	0	0	0	0	0	0	3.90 GiB	4.77 GiB
7	projects	index_projects_on_last_repository_check_failed	0	0	0	0	0	0	0	0	3.89 GiB	4.77 GiB
8	projects	index_projects_on_pending_delete	0	0	0	0	0	0	0	0	3.89 GiB	4.77 GiB
9	users	index_users_on_accepted_term_id	0	0	0	0	0	0	0	0	2.07 GiB	3.55 GiB
10	ci_runners	index_ci_runners_on_is_shared	0	0	0	0	0	0	0	0	2.03 GiB	337.54 MiB
11	merge_request_metrics	index_mr_metrics_on_target_project_id_merged_at_time_to_merge	0	0		0	0	0	0	0	2.00 GiB	6.06 GiB
12	notes	note_mentions_temp_index	0	0	0	0	0	0	0	0	1.75 GiB	299.19 GiB
13	namespaces	index_namespaces_on_shared_and_extra_runners_minutes_limit	0	0	0		0	0	0	0	1.27 GiB	2.56 GiB
14	namespaces	index_namespaces_on_ldap_sync_last_update_at	0	0	0	0	0	0	0	0	1.22 GiB	2.56 GiB



# K003 Top-50 Queries by total\_time

## Observations

Data collected: 2021-01-11 13:40:41 +0000 UTC  
Current database: gitlabhq\_production

Master (10.220.16.106)

Start: 2021-01-11T13:05:57.091968+00:00  
End: 2021-01-11T13:39:07.728772+00:00  
Period seconds: 1990.6368  
Period age: 00:33:10.636804

Error (calls): 0.00 (0.00%)  
Error (total time): 0.00 (0.00%)

The list is limited to 50 items.

# (query id)	Query	Calls	▼ Total time	Rows	shared_blks_hit	shared_blks_read	shared_blks_dirtied	shar
1 (-6386890822646777000)	SELECT "users".* FROM "users" INNER JOIN "project_authorizations" ON "users"."id" = "project_authorizations"."user_id" WHERE "project_authorizations"."project_id" = \$1 /application:web,correlation_id:Lmz5Aaf8Vpa/ <a href="#">Full query</a>	72,767 36.55/sec 1.00/call 0.16%	1,140,899.14 ms 573.133 ms/sec 15.679 ms/call 15.52%	7,371,979 3.71K/sec 101.31/call 4.57%	33,889,906 blks 17.03K blks/sec 465.73 blks/call 2.86%	816,616 blks 410.23 blks/sec 11.22 blks/call 9.36%	4,870 blks 2.45 blks/sec 0.07 blks/call 0.20%	148 0.07 0.00 3.12
2 (-7232084447659837000)	WITH RECURSIVE "namespaces_cte" AS ((SELECT "namespaces"."id", "members"."access_level" FROM "namespaces" INNER JOIN "members" ON "namespaces"."id" = "members"."source_id" WHERE "members"."type" = \$1 AND "members"."source_type" = \$2 AND "namespaces"."type" = \$3 AND "members"."user_id" = \$4 AND "members"."requested_at" IS NULL AND (access_level >= \$5)) UNION ( SELECT "namespaces"."id", LEAST( "members"."access_level", "group_group_links"."group_access") AS access_level FROM "namespaces" INNER JOIN "group_group_links" ON "group_group_links"."shared_group_id" = "namespaces"."id" INNER JOIN "members" ON "group_group_links"."shared_with_group_id" = "members"."source_id" AND "members"."source_type" = \$6 AND "members"."requested_at" IS NULL AND "members"."user_id" = \$7 AND "members"."access_level" > \$8 WHERE "namespaces"."type" = \$9) UNION (SELECT "namespaces"."id", GREATEST("members"."access_level"	41,162 20.68/sec 1.00/call 0.09%	995,280.30 ms 499.981 ms/sec 24.180 ms/call 13.54%	89,469,596 44.95K/sec 2.18K/call 55.44%	504,881,421 blks 253.63K blks/sec 12.27K blks/call 42.55%	33,166 blks 16.66 blks/sec 0.81 blks/call 0.38%	954 blks 0.48 blks/sec 0.02 blks/call 0.04%	1 bl 0.00 0.00 0.02

K002 Workload Type ("The First Word" Analysis)

Observations

Data collected: 2021-01-11 13:40:41 +0000 UTC  
Current database: gitlabhq\_production

Master (10.220.16.106)

Start: 2021-01-11T13:05:57.091968+00:00  
End: 2021-01-11T13:39:07.728772+00:00  
Period seconds: 1990.6368  
Period age: 00:33:10.636804

Error (calls): 0.00 (0.00%)  
Error (total time): 0.00 (0.00%)

#	Workload type	Calls	▼ Total time	Rows	shared_blks_hit	shared_blks_read	shared_blks_dirtied	shared_blks_written	blk_read_time	blk_write_time	kcach
1	select	41,827,896 21.02K/sec 1.00/call 94.08%	5,019,032.35 ms 2521.320 ms/sec 0.120 ms/call 68.28%	68,804,876 34.57K/sec 1.64/call 42.63%	604,189,040 blks 303.52K blks/sec 14.44 blks/call 50.92%	6,911,927 blks 3.48K blks/sec 0.17 blks/call 79.21%	95,009 blks 47.73 blks/sec 0.00 blks/call 3.81%	3,913 blks 1.97 blks/sec 0.00 blks/call 82.55%	1,373,499.10 ms 689.980 ms/sec 0.033 ms/call 73.22%	92.86 ms 0.047 ms/sec 0.000 ms/call 81.72%	0.00 b 0.00 b 0.00 b 0.00%
2	with	752,897 378.22/sec 1.00/call 1.69%	1,066,397.37 ms 535.707 ms/sec 1.416 ms/call 14.51%	90,927,447 45.68K/sec 120.77/call 56.34%	512,703,313 blks 257.56K blks/sec 680.97 blks/call 43.21%	33,166 blks 16.66 blks/sec 0.04 blks/call 0.38%	954 blks 0.48 blks/sec 0.00 blks/call 0.04%	1 blks 0.00 blks/sec 0.00 blks/call 0.02%	6,402.21 ms 3.216 ms/sec 0.009 ms/call 0.34%	0.04 ms 0.000 ms/sec 0.000 ms/call 0.04%	0.00 b 0.00 b 0.00 b 0.00%
3	update	999,462 502.08/sec 1.00/call 2.25%	755,406.99 ms 379.480 ms/sec 0.756 ms/call 10.28%	741,537 372.51/sec 0.74/call 0.46%	48,497,397 blks 24.37K blks/sec 48.52 blks/call 4.09%	1,211,149 blks 608.42 blks/sec 1.21 blks/call 13.88%	1,681,451 blks 844.68 blks/sec 0.00 blks/call 67.36%	533 blks 0.27 blks/sec 0.00 blks/call 11.24%	213,446.15 ms 107.225 ms/sec 0.214 ms/call 11.38%	13.47 ms 0.007 ms/sec 0.000 ms/call 11.85%	0.00 b 0.00 b 0.00 b 0.00%
4	insert	837,581 420.76/sec 1.00/call 1.88%	502,066.21 ms 252.214 ms/sec 0.599 ms/call 6.83%	873,121 438.61/sec 1.04/call 0.54%	21,046,160 blks 10.58K blks/sec 25.13 blks/call 1.77%	561,911 blks 282.28 blks/sec 0.67 blks/call 6.44%	711,983 blks 357.67 blks/sec 0.85 blks/call 28.52%	289 blks 0.15 blks/sec 0.00 blks/call 6.10%	282,057.24 ms 141.692 ms/sec 0.337 ms/call 15.04%	7.18 ms 0.004 ms/sec 0.000 ms/call 6.32%	0.00 b 0.00 b 0.00 b 0.00%
5	select ... for [no key] update	40,689 20.44/sec 1.00/call 0.09%	7,361.69 ms 3.698 ms/sec 0.181 ms/call 0.10%	40,689 20.44/sec 1.00/call 0.03%	207,484 blks 104.23 blks/sec 5.10 blks/call 0.02%	7,997 blks 4.02 blks/sec 0.20 blks/call 0.09%	6,751 blks 3.39 blks/sec 0.17 blks/call 0.27%	4 blks 0.00 blks/sec 0.00 blks/call 0.08%	361.00 ms 0.181 ms/sec 0.009 ms/call 0.02%	0.08 ms 0.000 ms/sec 0.000 ms/call 0.07%	0.00 b 0.00 b 0.00 b 0.00%

Replica servers:

Replica (10.220.16.101)

Start: 2021-01-11T13:05:51.048781+00:00  
End: 2021-01-11T13:36:10.229216+00:00  
Period seconds: 1819.18044  
Period age: 00:30:19.180435

#	Workload type	Calls	▼ Total time	Rows	shared_blks_hit	shared_blks_read	shared_blks_dirtied	shared_blks_written	blk_read_time	blk_write_time	kcach
1	select	20,300,433 11.16K/sec	9,206,677.68 ms 5060.893 ms/sec	29,084,119 15.99K/sec	4,829,058,098 blks 2.66M blks/sec	12,903,398 blks 7.10K blks/sec	0 blks 0.00 blks/sec	401,782 blks 220.86 blks/sec	866,803.16 ms 476.480 ms/sec	10,641.69 ms 5.850 ms/sec	0.00 0.00

# K001 Globally Aggregated Query Metrics

## Observations

Data collected: 2021-01-11 13:40:41 +0000 UTC  
Current database: gitlabhq\_production

### Master (10.220.16.106)

Start: 2021-01-11T13:05:57.091968+00:00  
End: 2021-01-11T13:39:07.728772+00:00  
Period seconds: 1990.6368  
Period age: 00:33:10.636804

Error (calls): 0.00 (0.00%)  
Error (total time): 0.00 (0.00%)

Calls	Total time	Rows	shared_blks_hit	shared_blks_read	shared_blks_dirtied	shared_blks_written	blk_read_time	blk_write_time
44,458,525 22.34K/sec 1.00/call 100.00%	7,350,264.61 ms 3692.419 ms/sec 0.165 ms/call 100.00%	161,387,670 81.08K/sec 3.63/call 100.00%	1,186,643,394 blks 596.12K blks/sec 26.69 blks/call 100.00%	8,726,150 blks 4.39K blks/sec 0.20 blks/call 100.00%	2,496,148 blks 1.26K blks/sec 0.06 blks/call 100.00%	4,740 blks 2.38 blks/sec 0.00 blks/call 100.00%	1,875,765.69 ms 942.294 ms/sec 0.042 ms/call 100.00%	1,875,765.69 ms 942.294 ms/sec 0.042 ms/call 100.00%

### Replica servers:

#### Replica (10.220.16.101)

Start: 2021-01-11T13:05:51.048781+00:00  
End: 2021-01-11T13:36:10.229216+00:00  
Period seconds: 1819.18044  
Period age: 00:30:19.180435

Calls	Total time	Rows	shared_blks_hit	shared_blks_read	shared_blks_dirtied	shared_blks_written	blk_read_time	blk_write_time
21,518,698 11.83K/sec 1.00/call 100.00%	9,393,835.91 ms 5163.774 ms/sec 0.437 ms/call 100.00%	31,311,433 17.22K/sec 1.46/call 100.00%	4,887,880,546 blks 2.69M blks/sec 227.15 blks/call 100.00%	12,921,880 blks 7.11K blks/sec 0.60 blks/call 100.00%	0 blks 0.00 blks/sec 0.00 blks/call 0.00%	402,350 blks 221.17 blks/sec 0.02 blks/call 100.00%	868,082.59 ms 477.183 ms/sec 0.040 ms/call 100.00%	10,229,216.16 ms 5.63 ms/sec 0.00 ms/call 100.00%

#### Replica (10.220.16.102)

Start: 2021-01-11T13:05:52.314852+00:00  
End: 2021-01-11T13:36:39.061152+00:00  
Period seconds: 1846.7463  
Period age: 00:30:46.7463

Calls	Total time	Rows	shared_blks_hit	shared_blks_read	shared_blks_dirtied	shared_blks_written	blk_read_time	blk_write_time
23,905,903 12.95K/sec 1.00/call 100.00%	9,934,511.91 ms 5379.468 ms/sec 0.416 ms/call 100.00%	32,988,938 17.87K/sec 1.38/call 100.00%	5,015,880,782 blks 2.72M blks/sec 208.82 blks/call 100.00%	13,968,380 blks 7.57K blks/sec 0.58 blks/call 100.00%	0 blks 0.00 blks/sec 0.00 blks/call 0.00%	514,997 blks 278.87 blks/sec 0.02 blks/call 100.00%	758,241.41 ms 410.582 ms/sec 0.032 ms/call 100.00%	11,029,216.16 ms 6.1 ms/sec 0.00 ms/call 100.00%

# Postgres.ai

- clone DB of any size in a few seconds in bring them in any point of the DevOps lifecycle
  - automated (in CI) testing of DB migrations
  - guess-free SQL optimization
  - instant deployment of full-size staging apps



GitLab

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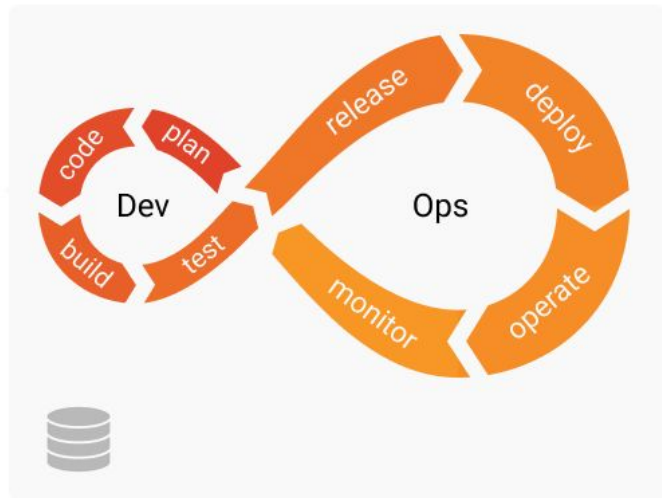
CDEK

EB

UNGRES

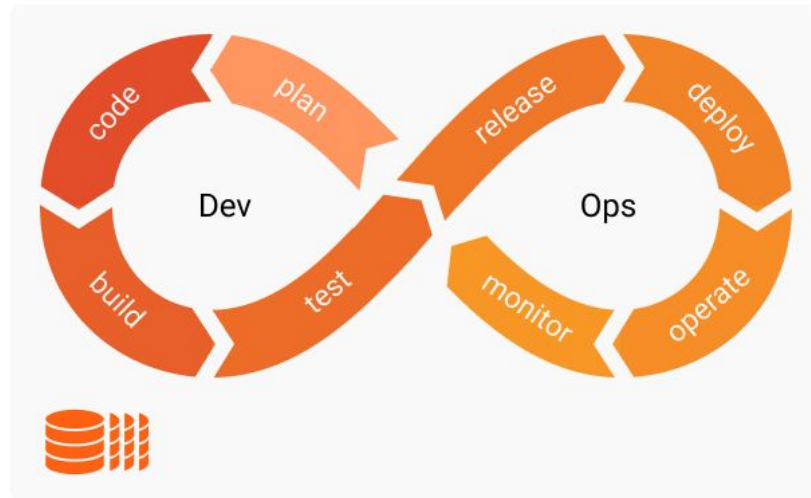
## Non-production environment weaknesses are reasons of multiple development problems

Development bottlenecks  
(with standard staging DB)



- ✗ Bugs: difficult to reproduce, easy to miss
- ✗ Not 100% of changes are well-verified
- ✗ SQL optimization is hard
- ✗ Each non-prod big DB costs a lot
- ✗ Non-prod DB refresh takes hours, days, weeks

Frictionless development  
(with Database Lab)

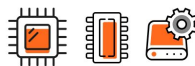


- ✓ Bugs: easy to reproduce, and fix early
- ✓ 100% of changes are well-verified
- ✓ SQL optimization can be done by anyone
- ✓ Non-prod DB refresh takes seconds
- ✓ Extra non-prod DBs doesn't cost a penny

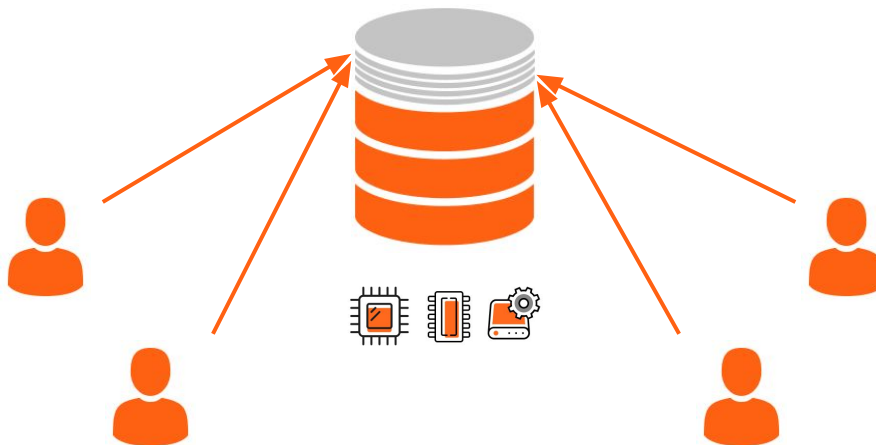
## Database experiments – traditional approach



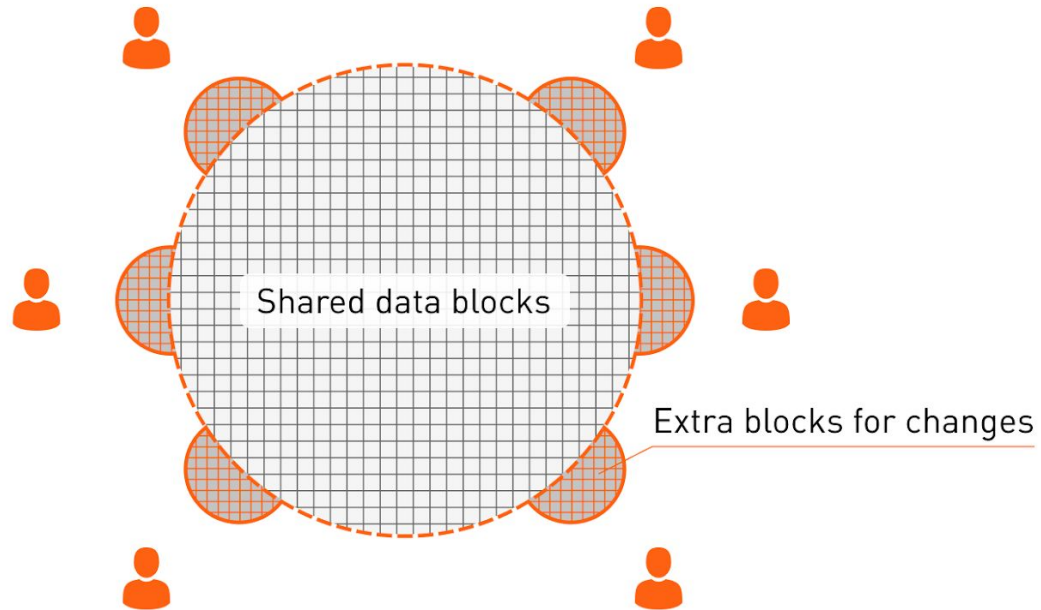
## Database experiments on thin clones





Production



## Thin clones – copy-on-write



-  Thick copy of production (any size)
-  Thin clone (size starts from 1 MB, depends on changes)



# Database experiments on thin clones – yes and no

## Yes

- Check execution plan – Joe bot
  - EXPLAIN w/o execution
  - EXPLAIN (ANALYZE, BUFFERS)
    - (timing is different; structure and buffer numbers – the same)
- Check DDL
  - index ideas (Joe bot)
  - auto-check DB migrations
- Heavy, long queries: analytics, dump/restore
  - No penalties! (think hot\_standby\_feedback, locks, CPU)



## No

- Load testing
- Regular HA/DR goals
  - backups
    - (but useful to check WAL stream, recover records by mistake)
- hot standby
  - (but useful to offload very long-running SELECTs)

# Database Lab – Open-core model



## Database Lab Engine

Open-source (AGPLv3)

- Thin cloning
- Automated provisioning and data refresh
- Data transformation, anonymization
- Supports managed Postgres (AWS RDS, etc.)

<https://gitlab.com/postgres-ai/database-lab>

## Platform

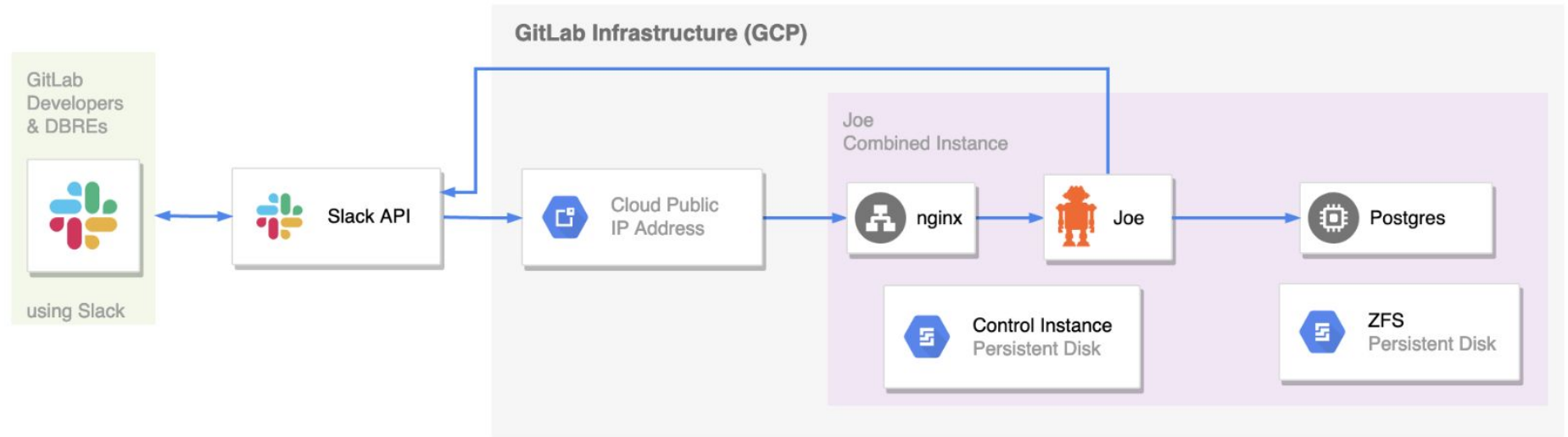
SaaS (pricing model: \$ per TiB)

- Web console (GUI)
- Access control, audit
- History, visualization
- Support

<https://postgres.ai/>

– follow the links and start using it for your databases

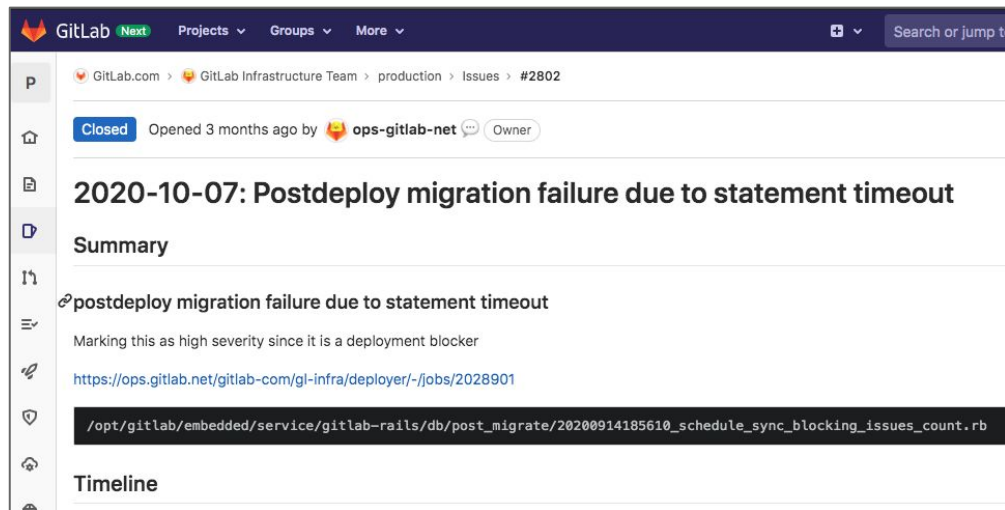
# SQL optimization using Database Lab and Joe bot



## Automated checks of database migrations (DDL) using full-size thin clones provided by Database Lab

Before Database Lab:

- Developers test DDL on tiny databases, using only synthetic data, not seeing real behavior
- Before each release, DDL is tested on staging – a reduced/old/modified data set (~5-10% of real size)
- Manual code review. Very rarely the change is tested on a production clone



Issues with deploying DB migrations were not uncommon

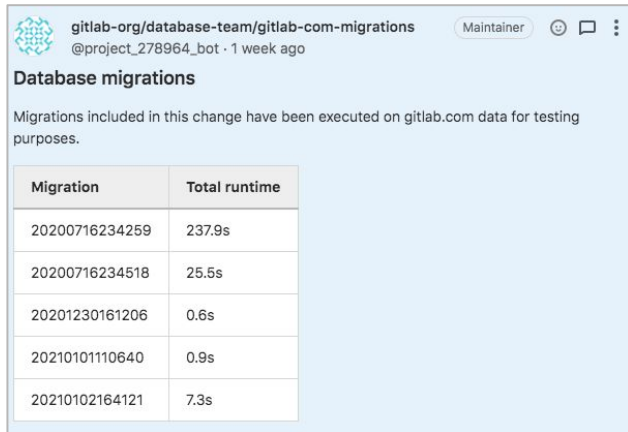
An example:

<https://gitlab.com/gitlab-com/gl-infra/production/-/issues/2802>

# Automated checks of database migrations (DDL) using full-size thin clones provided by Database Lab

With Database Lab:

- Separate project
  - security: limited access, firewall
  - isolation: reduced codebase and no extra components
  - connected to DLE API, able to use `dblab clone`
- On any CI build in the main project ("gitlab") has DDL, then:
  - a CI build in this special project is triggered
  - DDL is auto-verified on a fresh clone (lag <6h) provided by DLE
  - detailed artifacts are available to the Database Team and Infrastructure
    - Output
    - `pg_stat_***`
    - production timing estimates
    - Postgres logs
    - pgsa sampling
    - summary
  - summary is automatically posted as an MR comment



The screenshot shows a GitLab merge request interface. At the top, the repository is identified as 'gitlab-org/database-team/gitlab-com-migrations' with a 'Maintainer' role. The merge request title is 'Database migrations'. Below the title, a note states: 'Migrations included in this change have been executed on gitlab.com data for testing purposes.' A table follows, listing migration IDs and their total runtimes.

Migration	Total runtime
20200716234259	237.9s
20200716234518	25.5s
20201230161206	0.6s
20210101110640	0.9s
20210102164121	7.3s

# SQL Optimization chatbot ("Joe bot")

Postgres.ai Console β

Organization

Switch

This is a Demo organization, once you've explored Database Lab features: [Create new organization](#)

Organizations / Demo / SQL Optimization / Joe instances / Instance #20

Demo

Dashboard

Database Lab

Instances

Observed sessions

SQL Optimization

Ask Joe BOT

History

Checkup

Reports

Settings

General

Members

Access tokens

Billing

Audit

Documentation

Ask support

Nikolay

⊞

→

Ask Joe

Project and database

demo\_maindb\_125GB

Clear chat

You

2021-05-17 11:34:21

explain select from pgbench\_accounts where aid < 10000;

Joe Bot

2021-05-17 11:34:22

explain select from pgbench\_accounts where aid < 10000;

Session: webui-i4049

Plan with execution:

Index Only Scan using pgbench\_accounts\_pkey2 on public.pgbench\_accounts (cost=0.57..3342.79 rows=9289 width=0) (actual time=0.028..364.288 rows=9999 loops=1)  
Index Cond: (pgbench\_accounts.aid < 10000)  
Heap Fetches: 10144  
Buffers: shared hit=945 read=738 dirtied=627  
I/O Timings: read=290.933

Full execution plan

Other artifacts are provided below

Recommendations:

! Query processes too much data to return a relatively small number of rows. – Reduce data cardinality as early as possible during the execution, using one or several of the following techniques: new indexes, partitioning, query rewriting, denormalization. See the visualization of the plan to understand which plan nodes are the main bottlenecks. [Show details](#)

! VACUUM ANALYZE needed – Visibility map(s) for the table(s) involved in the query are outdated. For better performance: 1) run `VACUUM ANALYZE` on them as a one-time solution, 2) perform autovacuum tuning as a long-term permanent solution (tuning "vacuum" part of autovacuum). [Show details](#)

Profiling of wait events:

Command

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# SQL Optimization chatbot (“Joe bot”) – summary for a single query

## Profiling of wait events:

% time	seconds	wait_event
70.82	0.256244	IO.DataFileRead
14.63	0.052938	Running
14.55	0.052630	IO.SLRURead
100.00	0.361812	

## Summary:

Time: 366.157 ms

- planning: 1.104 ms
- execution: 365.053 ms (estimated\* for prod: 0.053...0.310 s)
  - I/O read: 290.933 ms
  - I/O write: N/A

### Shared buffers:

- hits: 945 (~7.40 MiB) from the buffer pool
- reads: 738 (~5.80 MiB) from the OS file cache, including disk I/O
- dirtied: 627 (~4.90 MiB)
- writes: 0

# SQL Optimization chatbot ("Joe bot") – History & Visualization

Postgres.ai Console  $\beta$

Organization Switch

**Demo**

Dashboard

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Ask Joe BOT

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Ask support

This is a Demo organization, once you've explored Database Lab features: [Create new organization](#)

Organizations / Demo / demo / SQL Optimization / History / Command #14032

Command #14032 (explain) from session #4049

Explain Depesz

Explain PEV2

Explain FlameGraph

Author:  
Nikolay Samokhvalov

Command:  
explain

Query:  
select from pgbench\_accounts where aid < 10000;

Plan:  

with execution

with execution (JSON)

w/o execution

Index Only Scan using pgbench\_accounts\_pkey2 on public.pgbench\_accounts (cost=0.57..3342.79 rows=9289 w/o execution) (actual time=0.000..0.000 rows=0) (plan cache hit)

Index Cond: (pgbench\_accounts.aid < 10000)

Heap Fetches: 10144

Buffers: shared hit=945 read=738 dirtied=627

Share

Visualization

Flame Graph (buffers)

Flame Graph (timing)

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# Database Lab “Observed sessions”

Postgres.ai Console  $\beta$

Organization

Switch

Organizations / Demo / Observed sessions / Database Lab observed session #34

Demo

Dashboard

Database Lab

Instances

Observed sessions

SQL Optimization

Ask Joe DOT

History

Checkout

Reports

Settings

General

Members

Access tokens

Billing

Audit

Nikolay

Database Lab observed session #34 Experimental

Summary

Status: ✖ Failed

Session: #34

Project: demo

DLE instance: #35

Duration: 2m, 5s

Created: 2 months ago

Branch: transform

Commit: 34e1264a823825f37aa78a7d6878c029f3e29301

Triggered by: Anatoly

PR/MR: [https://gitlab.com/postgres-ai/ci-example/-/merge\\_requests/2](https://gitlab.com/postgres-ai/ci-example/-/merge_requests/2)

Checklist

✖ Failed Dangerous locks is not observed during the session  
(13 intervals with locks of 10 allowed)

✔ Passed Session duration is within allowed interval  
(2m, 5s of 1h allowed)

Observed intervals and details

Hide intervals  $\wedge$

Started at	Duration
✔ 2020-11-03 14:58:19 UTC	10s
✖ 2020-11-03 14:58:29 UTC	10s

```
{
  "datname": "test_small",
  "relation": "141023",
  "transactionid": null,
  "mode": "AccessExclusiveLock",
  "locktype": "relation",
  "granted": true,
  "username": "ci_user",
  "query": "create table t1 as select i,
    random()::text as payload from generate_series(1, 100000000) i;",
  "query_start": "2020-11-03T14:58:26.655409+00:00",
  "state": "active",
  "wait_event_type": "IO",
  "wait_event": "WALInitWrite",
  "xact_start": "2020-11-03T14:58:26.614131+00:00",
  "xact_duration": "00:00:13.236948",
  "query_start": "2020-11-03T14:58:26.655409+00:00",
  "query_duration": "00:00:13.195677",
  "state_change": "2020-11-03T14:58:26.655413+00:00",
  "state_changed_ago": "00:00:13.195666",
  "pid": 45
}
```

```
{
  "datname": "test_small",
  "relation": "141028",
  "transactionid": null,
  "mode": "AccessExclusiveLock",
  "locktype": "relation",
  "granted": true,
  "username": "ci_user",
  "query": "create table t1 as select i,
    random()::text as payload from generate_series(1, 100000000) i;",
  "query_start": "2020-11-03T14:58:26.655409+00:00",
  "state": "active",
  "wait_event_type": "IO",
  "wait_event": "WALInitWrite",
  "xact_start": "2020-11-03T14:58:26.614131+00:00",
  "xact_duration": "00:00:13.23691",
  "query_start": "2020-11-03T14:58:26.655409+00:00",
  "query_duration": "00:00:13.195632",
  "state_change": "2020-11-03T14:58:26.655413+00:00",
  "state_changed_ago": "00:00:13.195628",
  "pid": 45
}
```

```
✖ 2020-11-03 14:58:39 UTC 10s
{
  "datname": "test_small",
  "relation": "141023",
  "transactionid": null,
  "mode": "AccessExclusiveLock",
  "locktype": "relation",
  "granted": true,
  "username": "ci_user",
  "query": "create table t1 as select i,
    random()::text as payload from generate_series(1, 100000000) i;",
  "query_start": "2020-11-03T14:58:26.655409+00:00",
  "state": "active",
  "wait_event_type": null,
  "wait_event": null,
  "xact_start": "2020-11-03T14:58:26.614131+00:00",
  "xact_duration": "00:00:23.237473",
  "query_start": "2020-11-03T14:58:26.655409+00:00",
  "query_duration": "00:00:23.196195",
  "state_change": "2020-11-03T14:58:26.655413+00:00",
  "state_changed_ago": "00:00:23.196191",
  "pid": 45
}
```

```
{
  "datname": "test_small",
  "relation": "141028",
  "transactionid": null,
  "mode": "AccessExclusiveLock",
  "locktype": "relation",
  "granted": true,
  "username": "ci_user",
  "query": "create table t1 as select i,
    random()::text as payload from generate_series(1, 100000000) i;",
  "query_start": "2020-11-03T14:58:26.655409+00:00",
  "state": "active",
  "wait_event_type": null,
  "wait_event": null,
  "xact_start": "2020-11-03T14:58:26.614131+00:00",
  "xact_duration": "00:00:23.237451",
  "query_start": "2020-11-03T14:58:26.655409+00:00",
  "query_duration": "00:00:23.196174",
  "state_change": "2020-11-
```

# Summary

- PostgreSQL database health check is automated
- All engineers now can do the following without delays:
  - get **EXPLAIN (ANALYZE, BUFFERS)** for any query for full-size DBs (not being blocked and not blocking others)
  - get insights of how DDL behaves before submitting MR for DB migration review
  - learn SQL by example (using full-size databases!)
- Database team has
  - Way to conduct various database experiments without need to provision new nodes and/or wait for long data refresh
  - DB migration reviews are pre-checked automatically in 100% of cases, with prediction of what would happen during production deployment



# Thank you. Please feel free to follow up!

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